

# Shallow Water Bathymetry With Multi-spectral Satellite Ocean Color Sensors: Leveraging Temporal Variation

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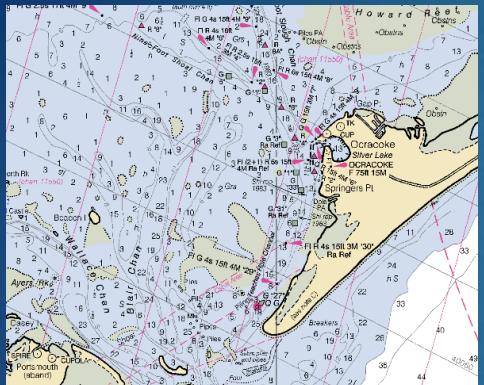
Collaborators: Z. P. Lee, H. O. Briceno, X. Yu, R. Garcia, L. Jiang, J. Wang, and K. Luis

NOCCG Seminar  
Nov 4, 2020  
3:00 pm – 4:00 pm



# A key element for navigation and ocean science

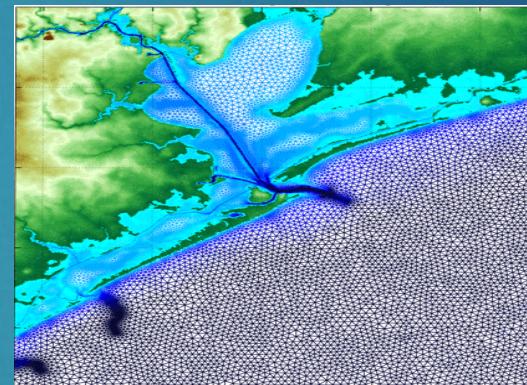
## ► Navigation



## ► Coastal morphology



## ► Dynamic modeling



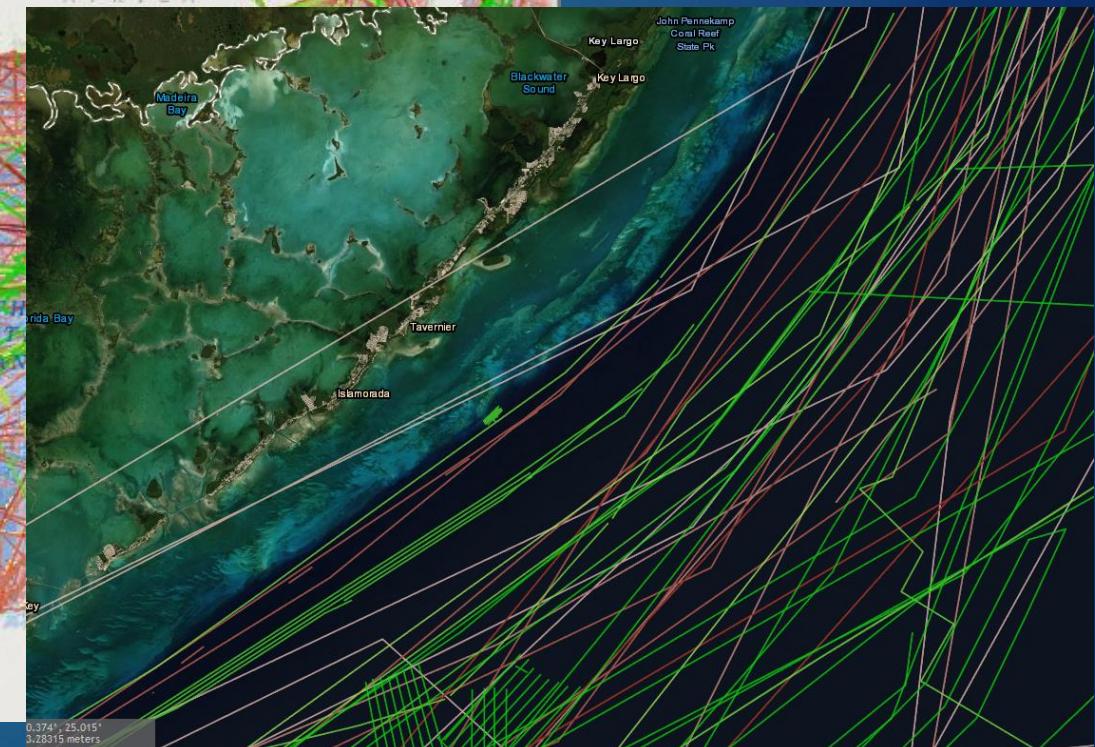
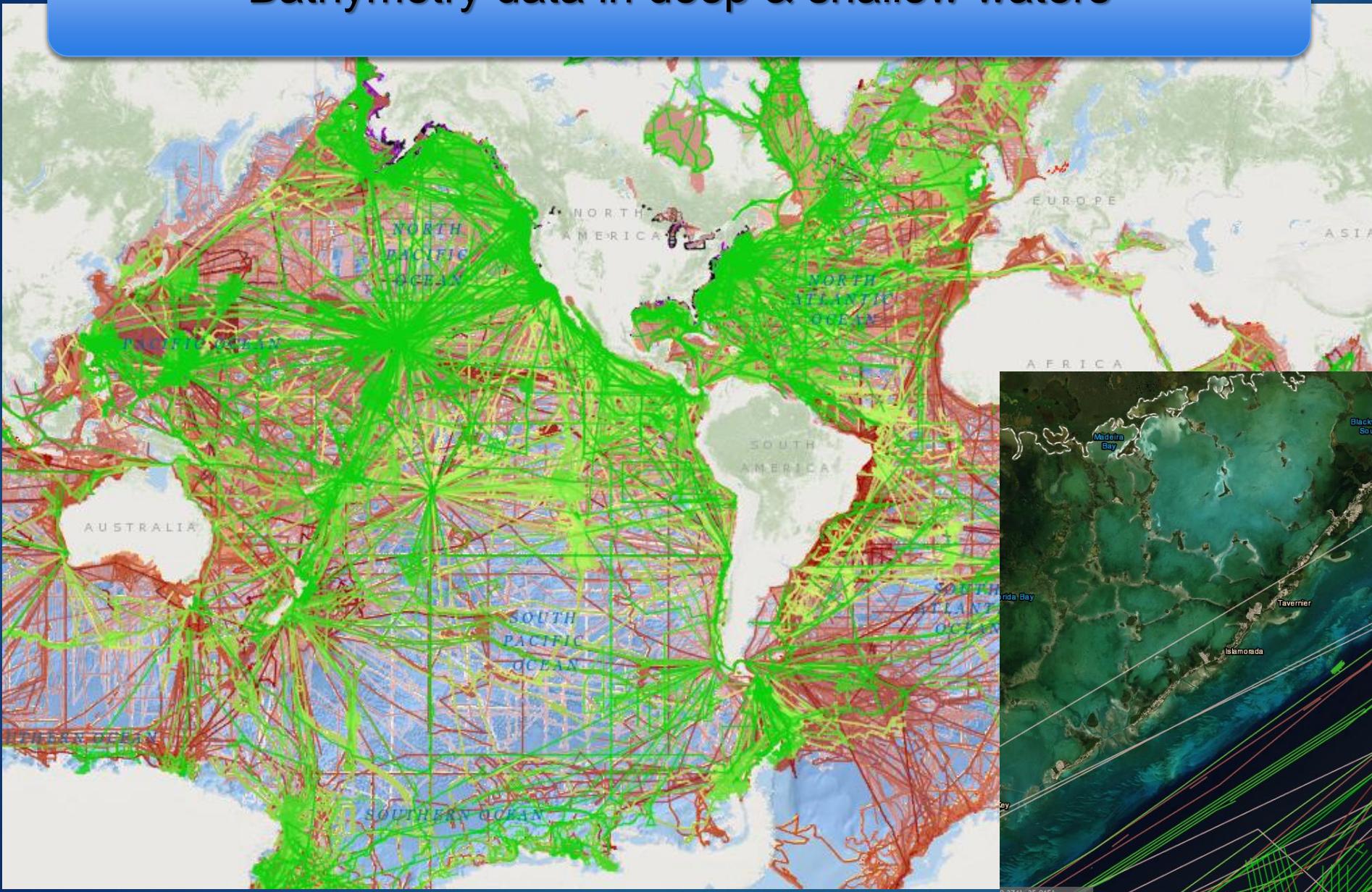
## ► Marine biology



Sources: [www](http://www)

# Bathymetry data in deep & shallow waters

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Source:  
NOAA National Centers for  
Environmental Information

## Optical sensing of shallow waters

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- Passive approach (e.g., Ocean Color) and active approach (e.g., LiDAR)
- Ocean color remote sensing provides an effective means of mapping shallow water bathymetry on synoptic scales

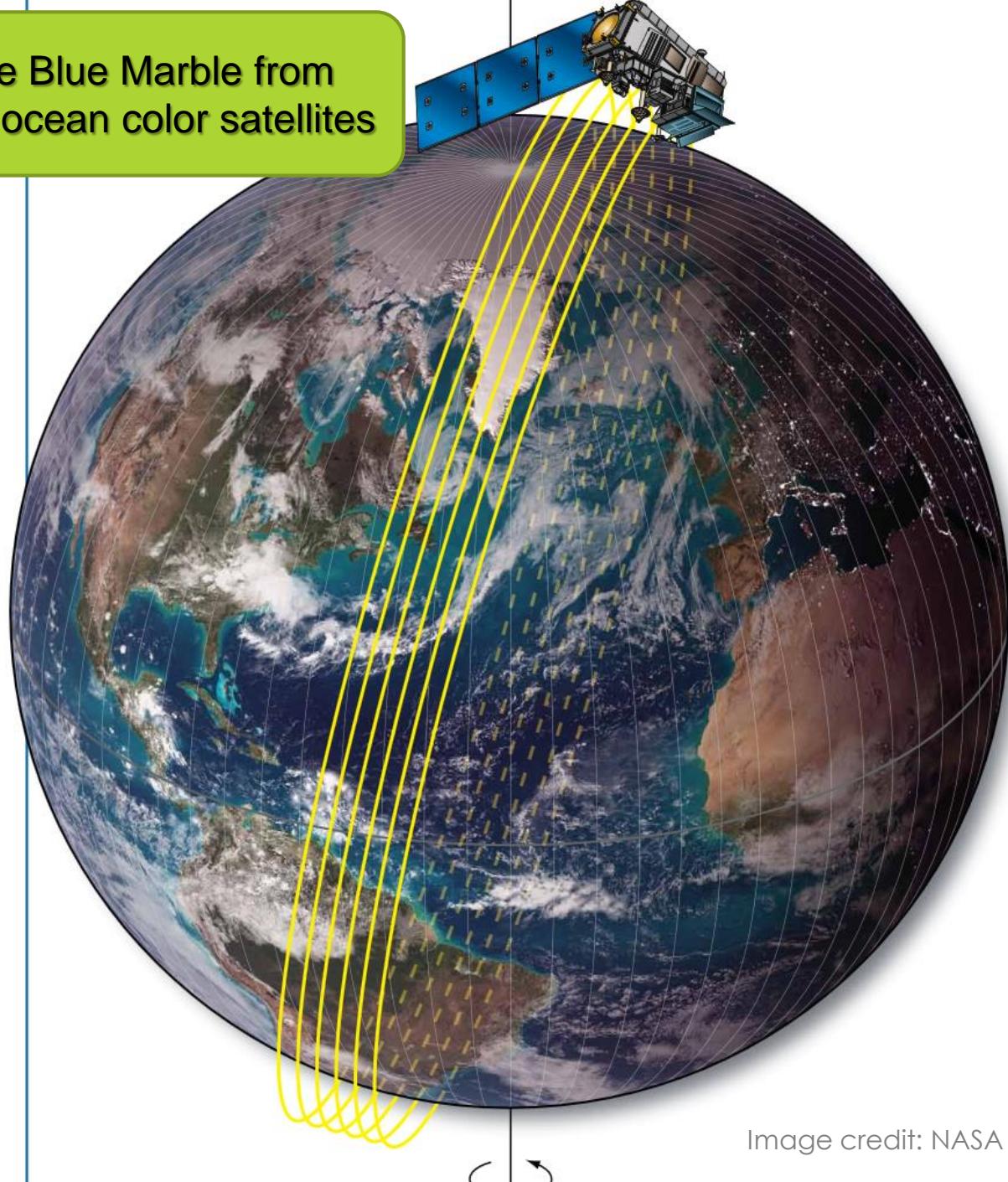


An “ocean color” snapshot

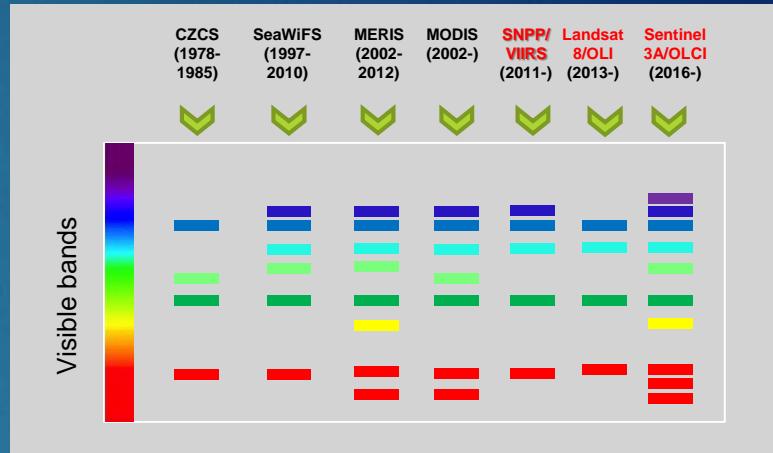


A conceptualized bathymetry map

## Mapping the Blue Marble from polar-orbiting ocean color satellites



### ► Multi-spectral ocean color images



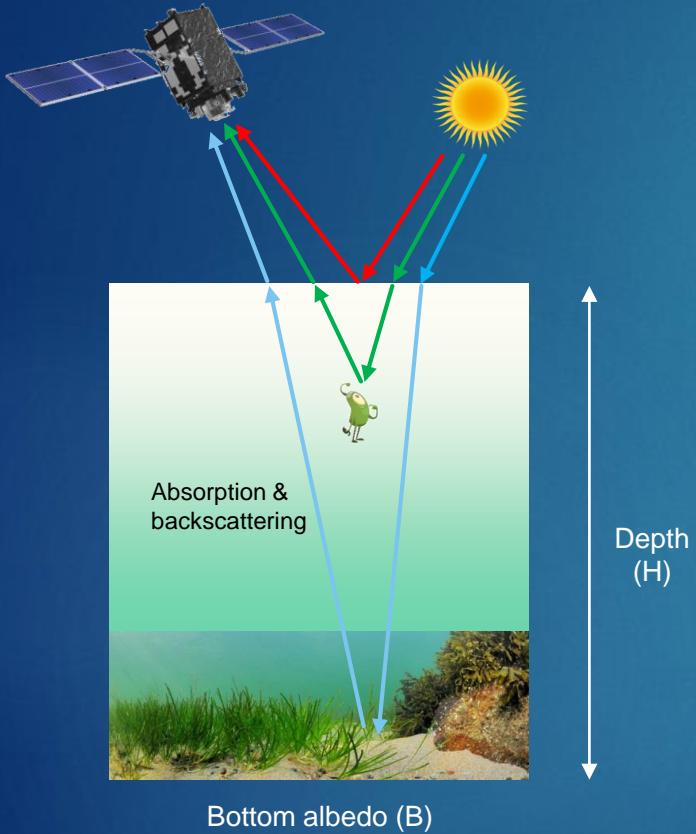
### ► Frequent revisit

- SNPP VIIRS: everyday
- Sentinel 3A OLCI: 2-3 days
- Landsat 8 OLI: 16 days

### ► Moderate-high spatial resolutions

- SNPP VIIRS: 750 m
- Sentinel 3A OLCI: 300 m
- Landsat 8 OLI: 30 m

# Remote sensing reflectance in shallow waters



## ► Remote sensing reflectance

Remote sensing reflectance ( $R_{rs}$ ) varies with water depth ( $H$ ), bottom albedo ( $B$ ), and water inherent optical properties (IOPs) including light absorption and backscattering coefficients.

### Forward model (it is nonlinear)

$$r_{rs}(\lambda) \approx r_{rs}^{dp}(\lambda) \cdot \left\{ 1 - \exp \left[ - \left( \frac{1}{\cos \theta_w} + \frac{D_0 (1 + D_1 \cdot u(\lambda))^{0.5}}{\cos \theta_a} \right) \cdot k(\lambda) \cdot H \right] \right\} + \frac{B(\lambda)}{\pi} \exp \left[ - \left( \frac{1}{\cos \theta_w} + \frac{D_0 (1 + D_1 \cdot u(\lambda))^{0.5}}{\cos \theta_a} \right) \cdot k(\lambda) \cdot H \right]$$

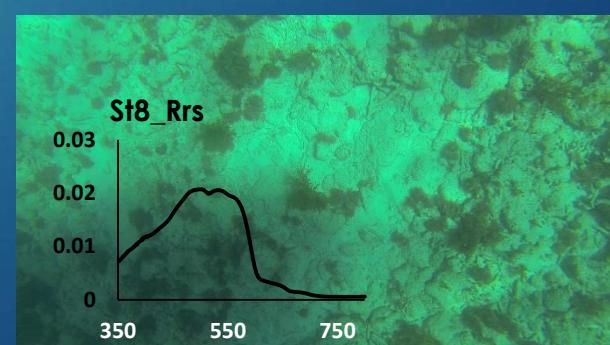
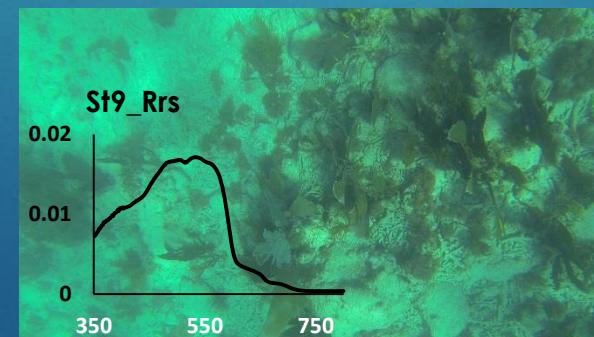
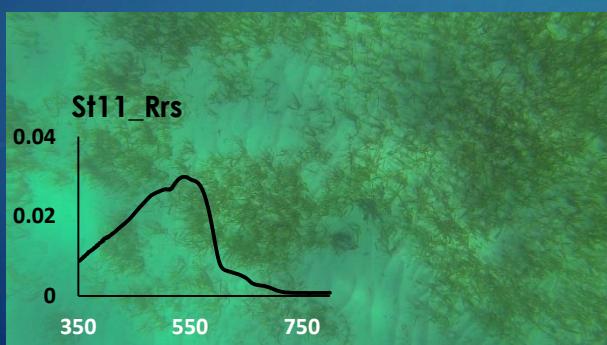
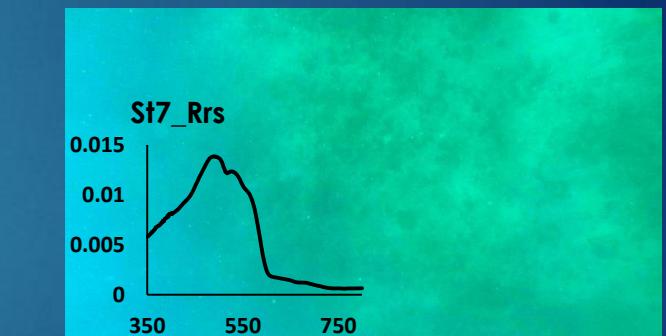
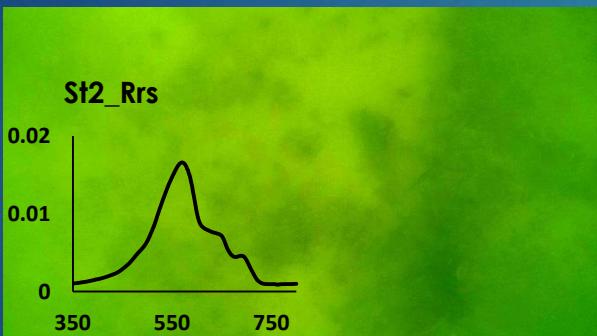
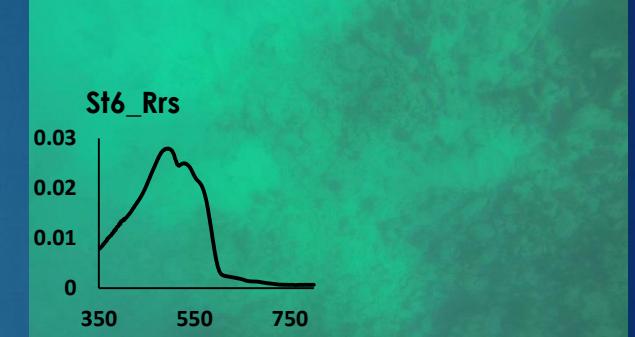
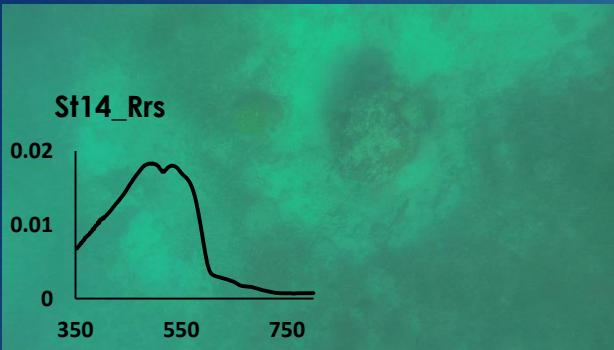
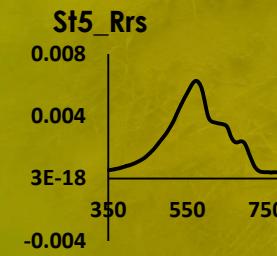
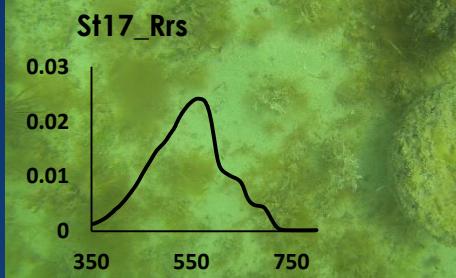
Lee et al. (1999)

## ► Optically shallow waters

Optically shallow waters are those where the light reflected off the seafloor still contributes significantly to the water-leaving radiance



## Rrs spectra over seagrass and algae bottoms



# Rrs spectra over coral reefs



# Inversion of ocean color spectra

Analytical inversion of the ocean color spectra is not straightforward as there exist more unknowns than available numbers of equations/relationships

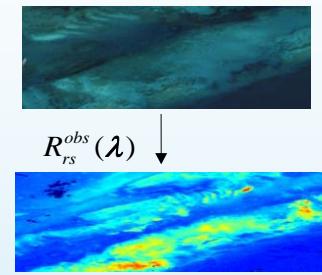
$$\left\{ \begin{array}{l} R_{rs}(\lambda_1) = \text{Fun}[P(\lambda_1), G(\lambda_1), X(\lambda_1), B(\lambda_1), H] \\ R_{rs}(\lambda_2) = \text{Fun}[P(\lambda_2), G(\lambda_2), X(\lambda_2), B(\lambda_2), H] \\ \quad \cdot \\ \quad \cdot \\ R_{rs}(\lambda_n) = \text{Fun}[P(\lambda_n), G(\lambda_n), X(\lambda_n), B(\lambda_n), H] \end{array} \right.$$

— — — — —

- $P$  : Absorption coefficient of phytoplankton
- $G$  : Absorption coefficient of CDOM and detritus
- $X$  : Backscattering coefficient of particles
- $B$  : Bottom albedo
- $H$  : Water depth

At least five bands are required to derive five unknowns

## Spectral-optimization algorithm (SOA)



Satellite-observed Rrs

$$[P, G, X, B, H] \implies R_{rs}^{\text{mod}}(\lambda)$$

Modeled Rrs

$$err = \frac{\left[ \sum (R_{rs}^{\text{mod}}(\lambda_i) - R_{rs}^{\text{obs}}(\lambda_i))^2 \right]^{1/2}}{\sum R_{rs}^{\text{obs}}(\lambda_i)}$$

Cost function

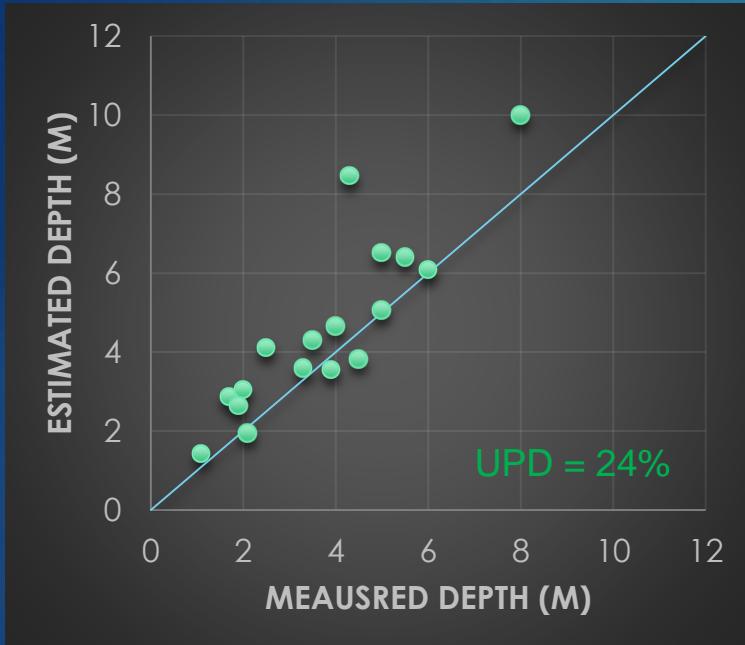
$$P, G, X, B, H$$

This approach does not require in situ measurements for calibration

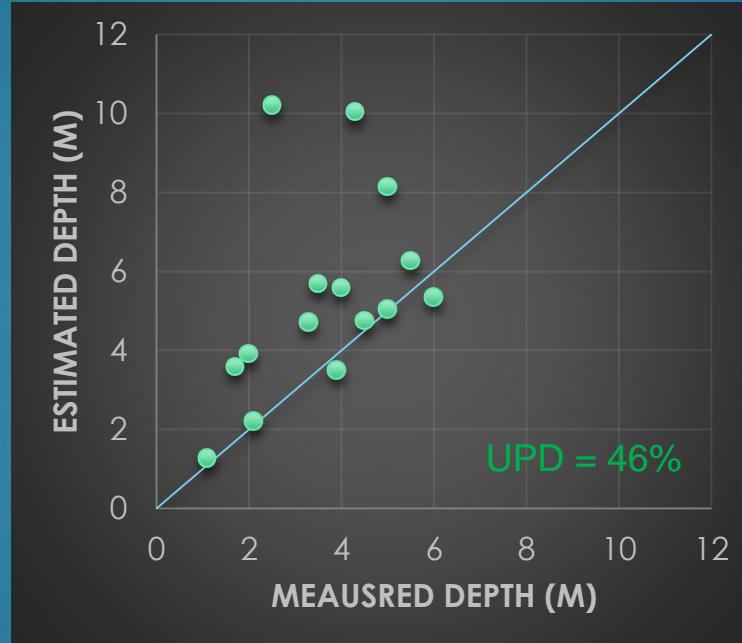
# Dependence on band numbers

10

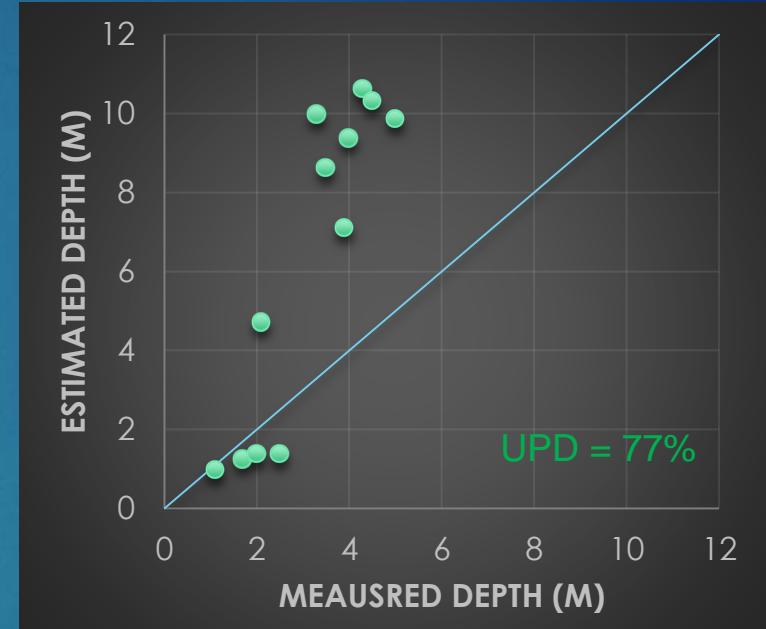
Hyperspectral



Five bands (SNPP/VIIRS)



Four bands (Landsat 8/OLLI)



400-700 nm, every 5 nm

412, 443, 486, 551, 671

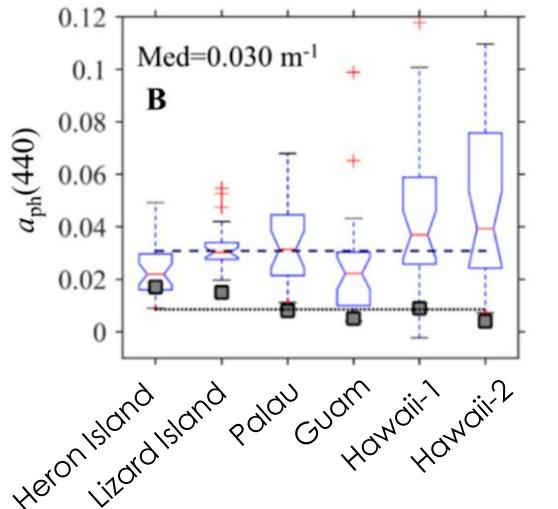
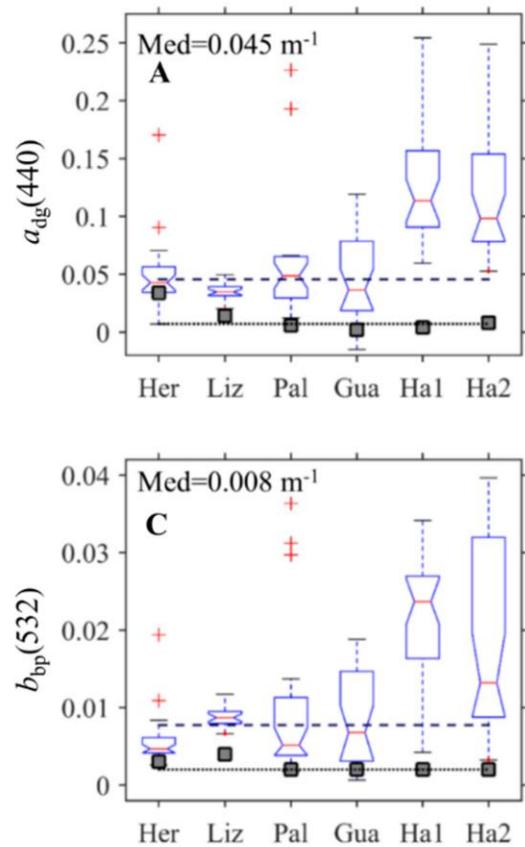
443, 482, 561, 655

- ❖ Hyper-spectral Rrs can be used for accurate retrieval of water depth from SOA
- ❖ It is more difficult to use multi-spectral Rrs for the retrieval of water depth with SOA

# Variation of water absorption and backscattering

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## Spatial variation



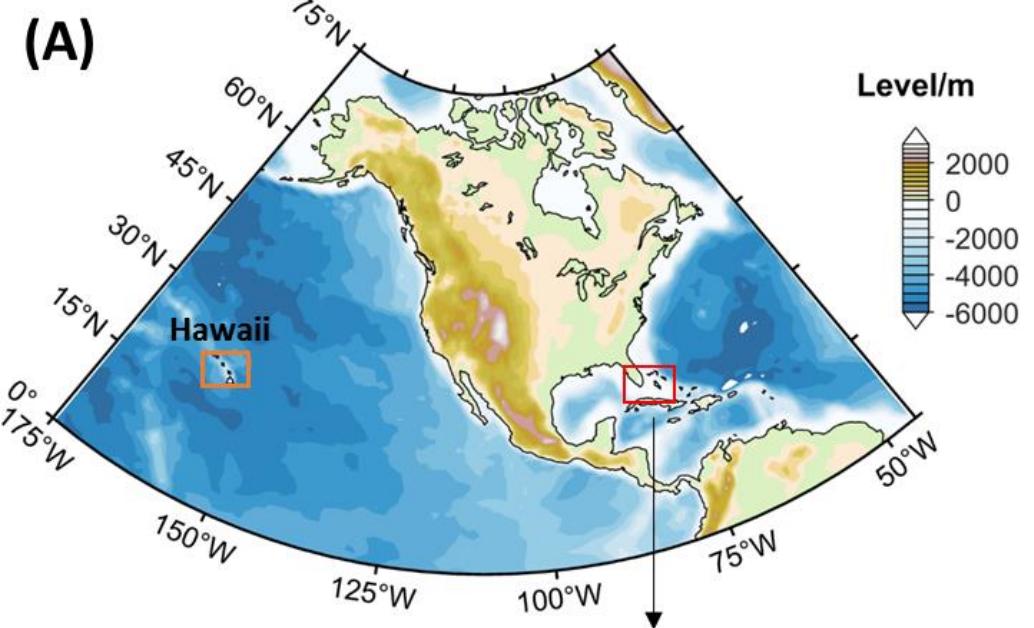
**Legend**

- $a_{dg}(440)$ : CDOM and detritus absorption
- $a_{ph}(440)$ : phytoplankton absorption
- $b_{bp}(532)$ : particle backscattering

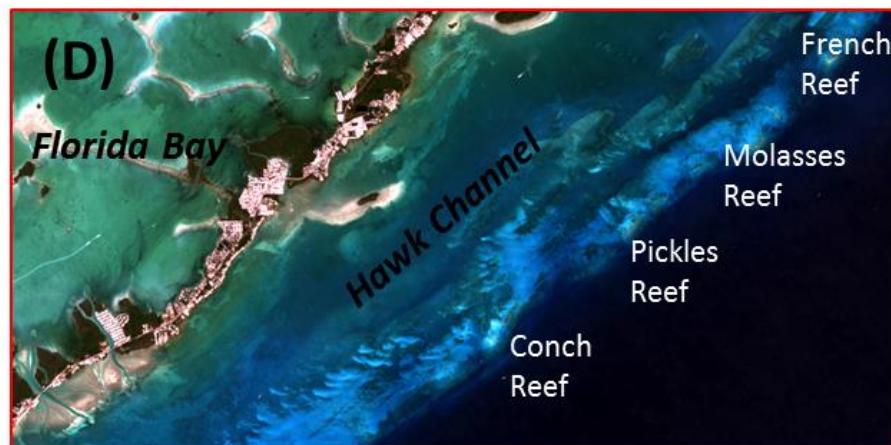
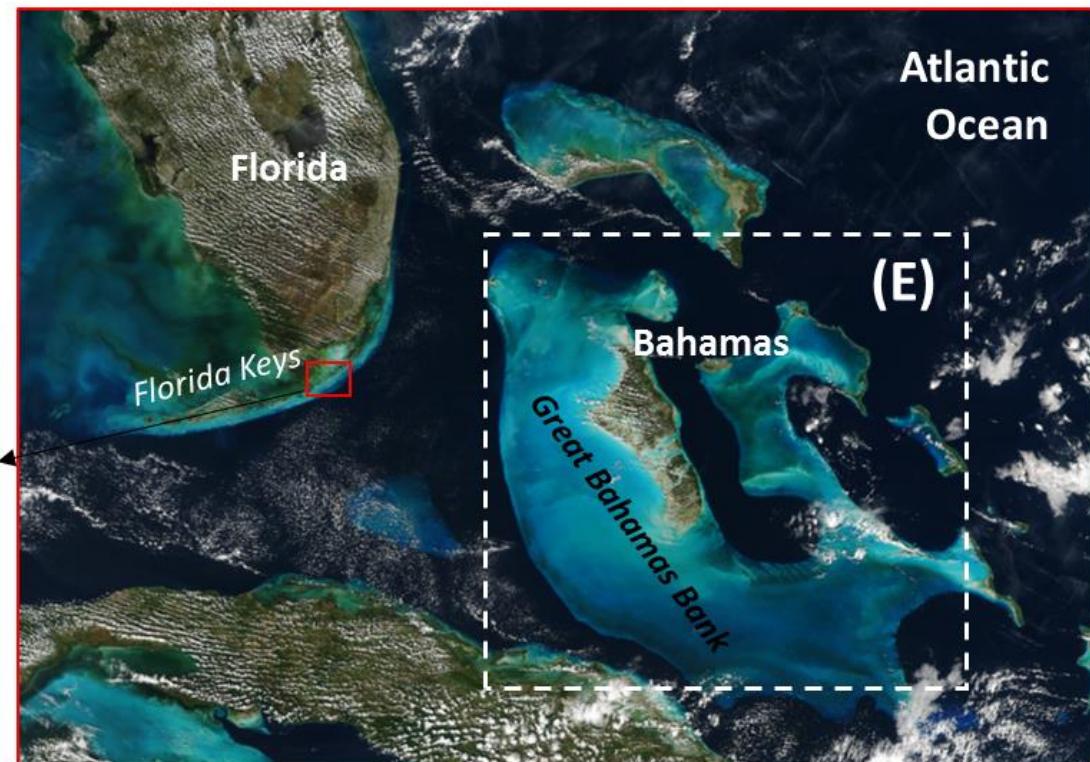
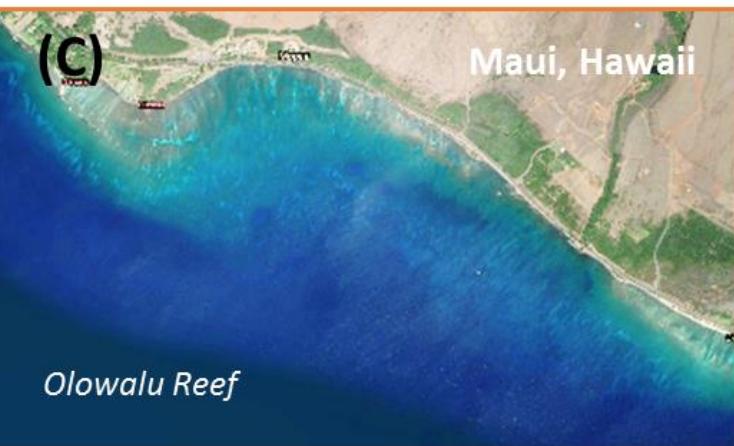
Russell et al. (2019)

## Temporal variation



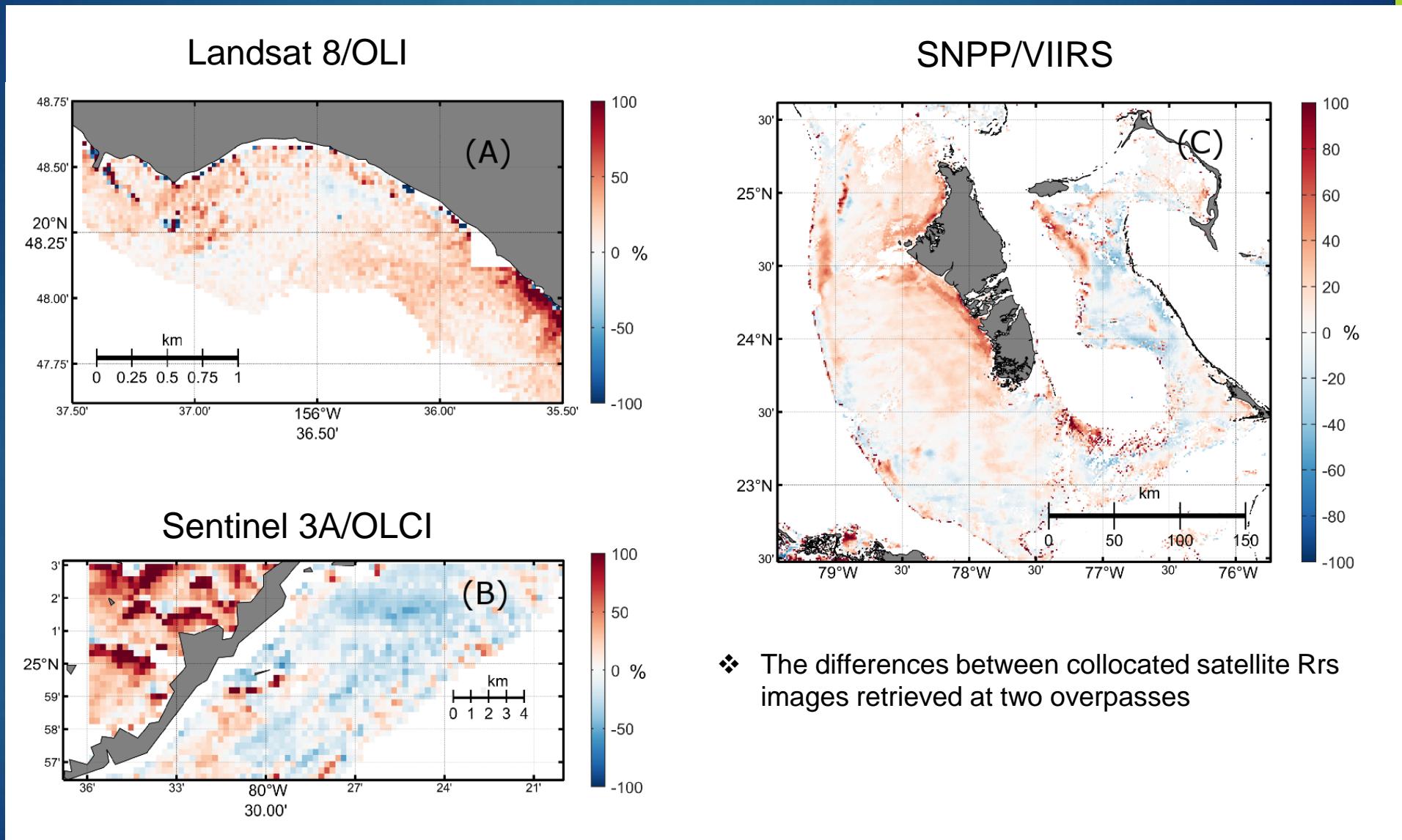


(B)



# Temporal variation of satellite Rrs images (443 nm)

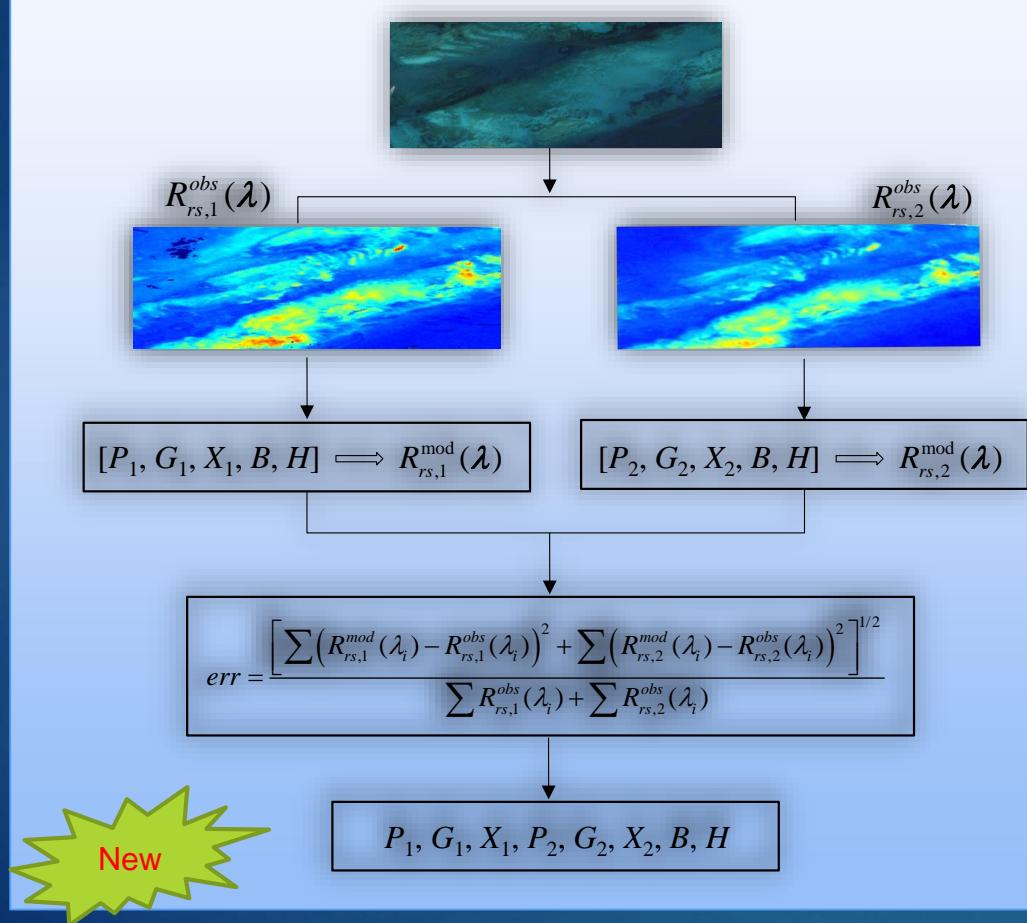
13



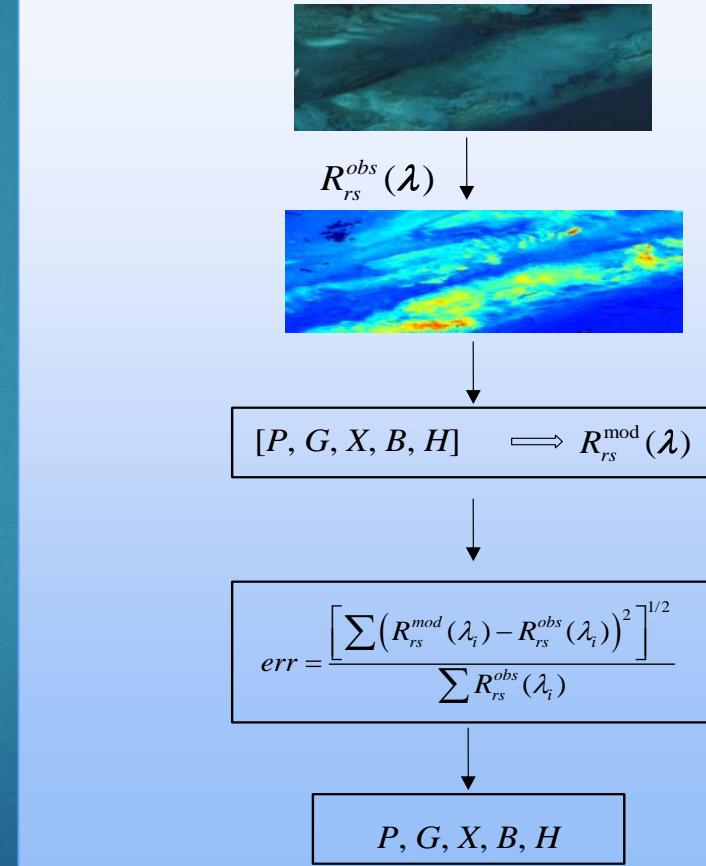
# Leveraging the temporal variation

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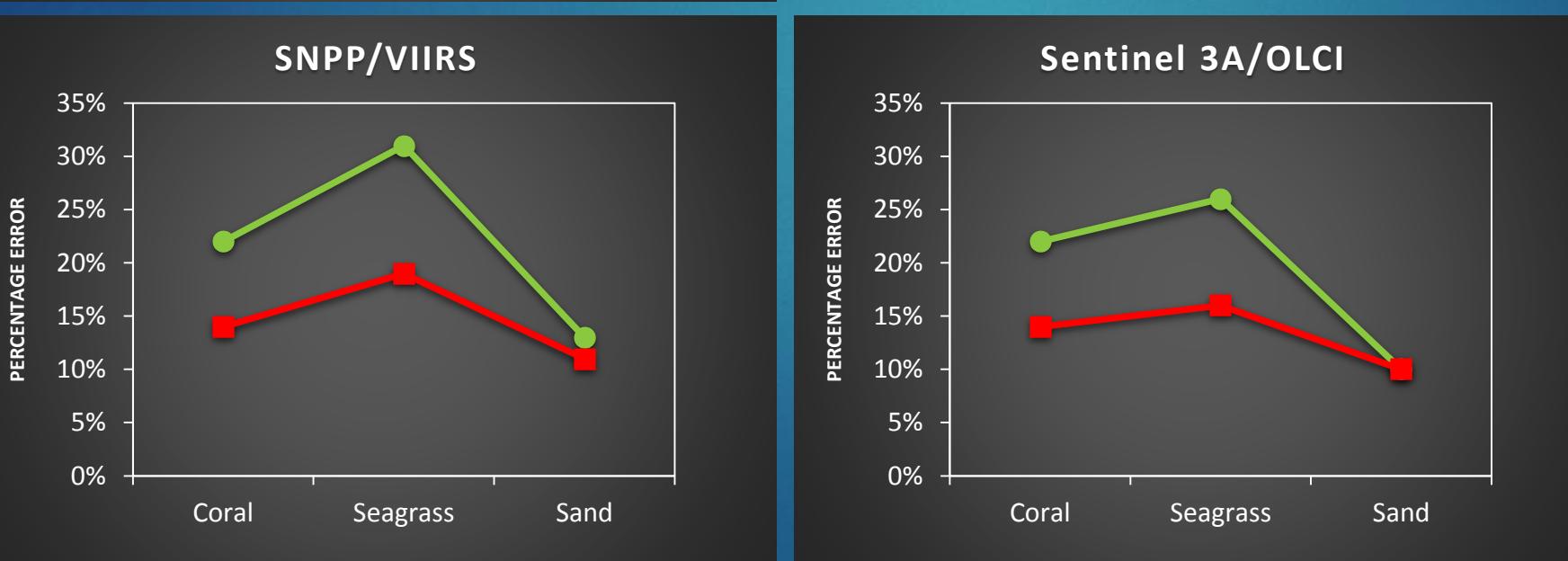
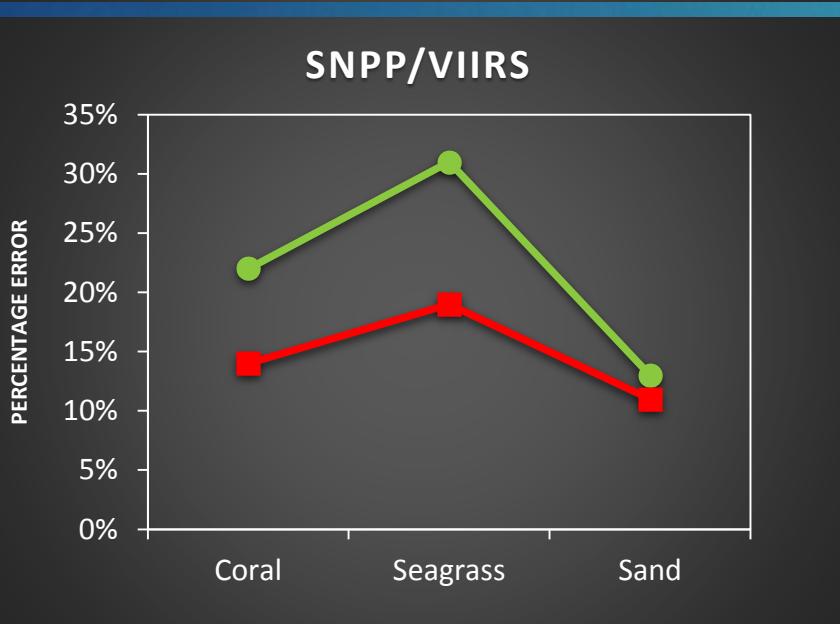
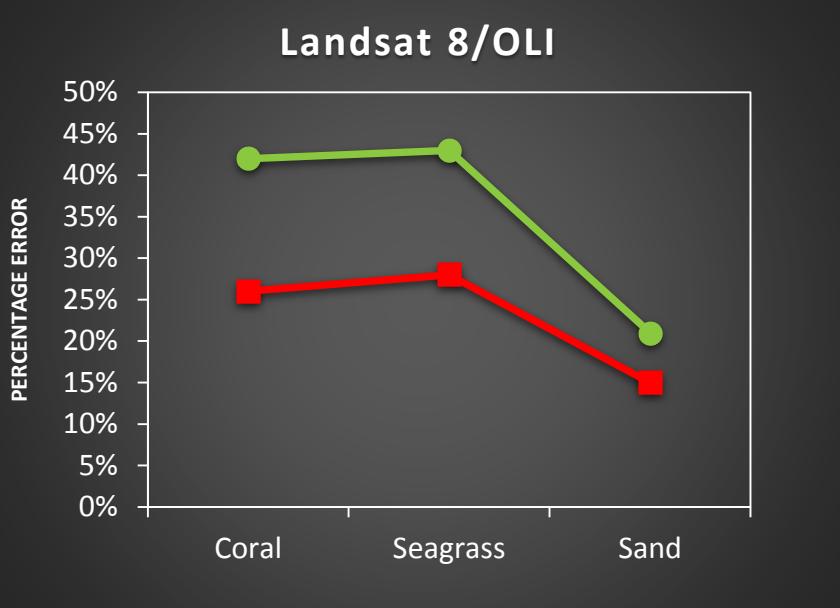
## Two-spectrum optimization approach (2-SOA)



## One-spectrum optimization approach (1-SOA)



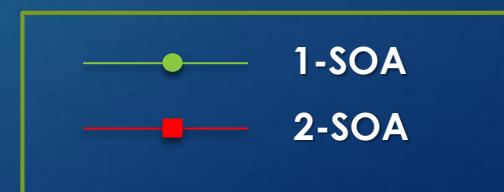
## Evaluation with synthetic data



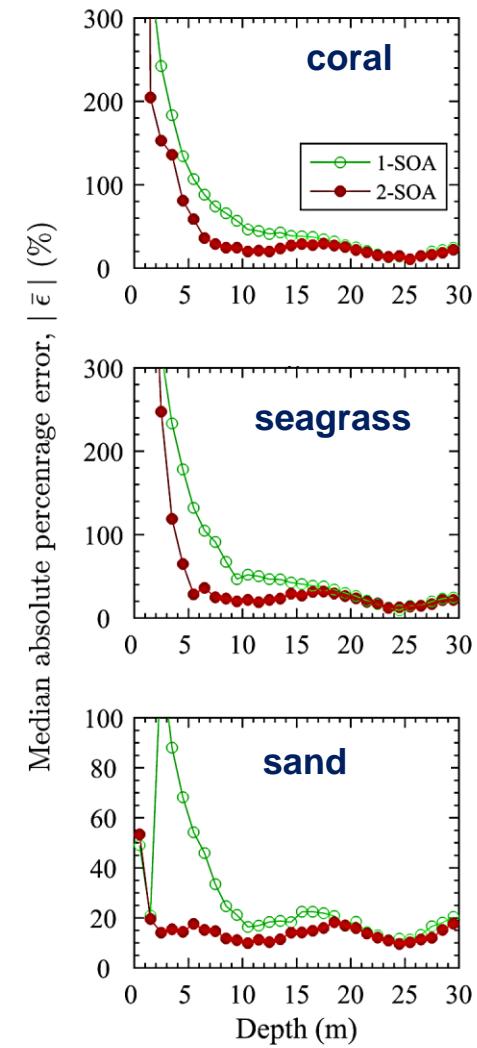
Shallow-water radiative transfer simulations:

- ▶ A range of water depths: 0.5 – 30 m
- ▶ Three types of benthic substrates: corals, seagrass, sand
- ▶ A wide range of light absorption & backscattering coefficients
- ▶ Paired Rrs spectra are constructed for each depths & benthic substrates

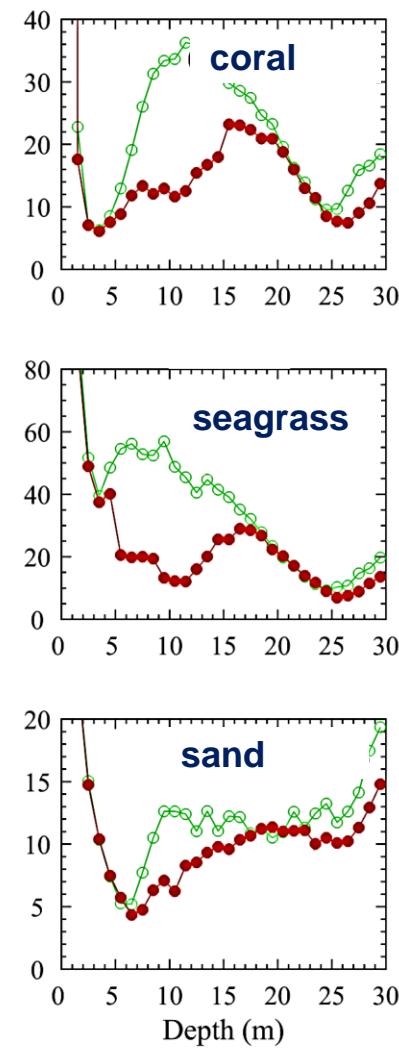
**Comparisons of the model performance for depth retrieval**



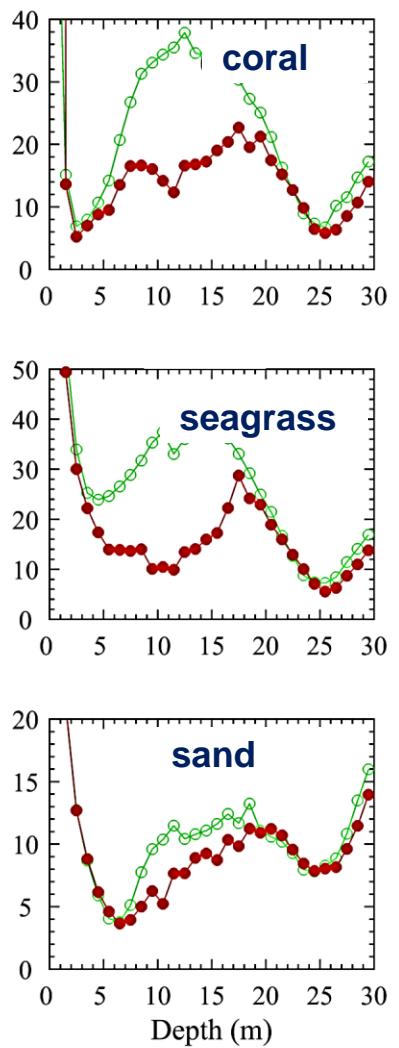
## ► Landsat 8/OLI



## ► SNPP/VIIRS



## ► Sentinel 3A/OLCI



## Bathymetry retrieval over coral reefs

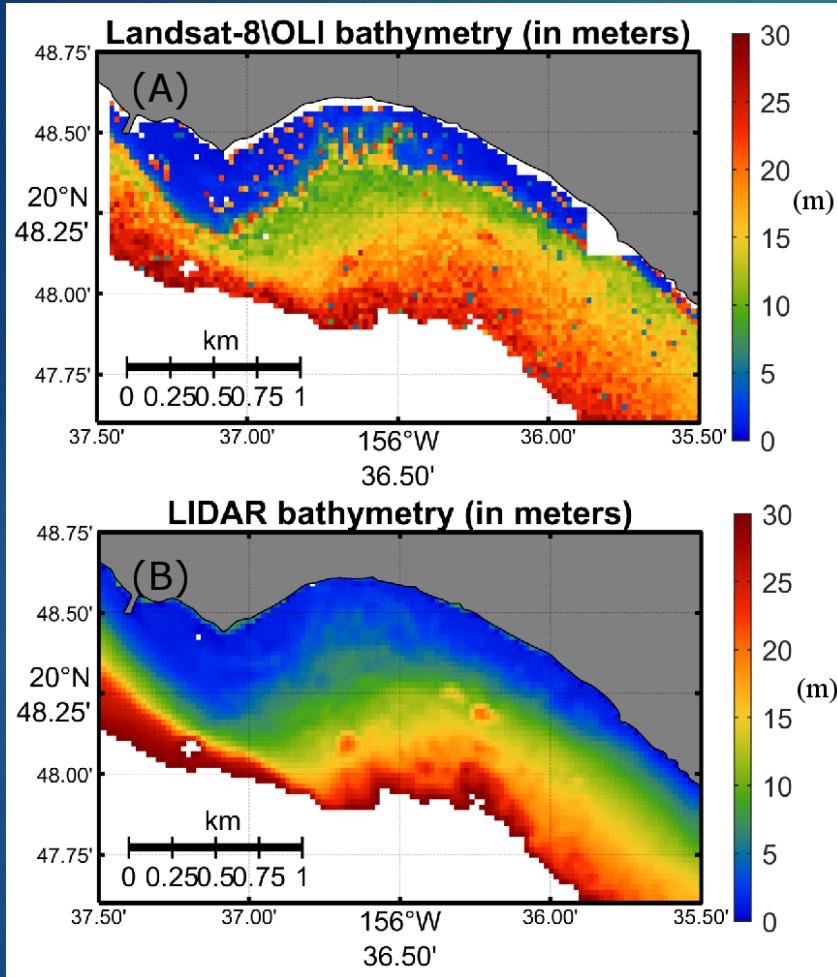
17



Olowalu Reef, Maui, HI

# Bathymetry retrieval over coral reefs

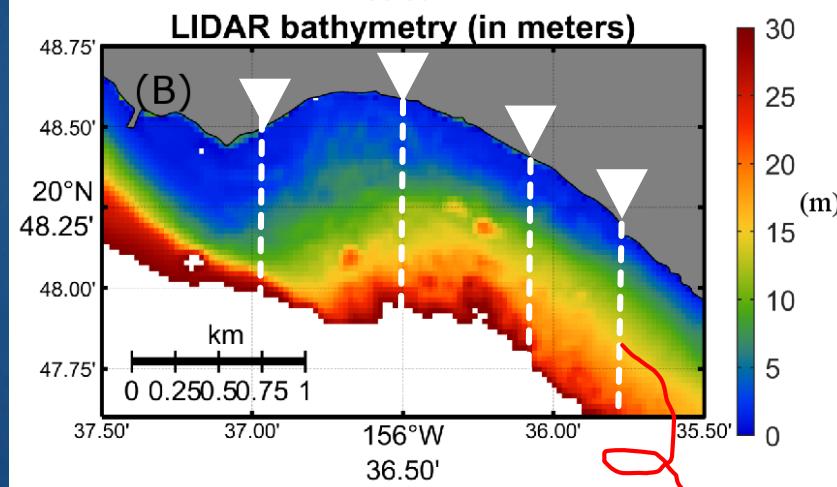
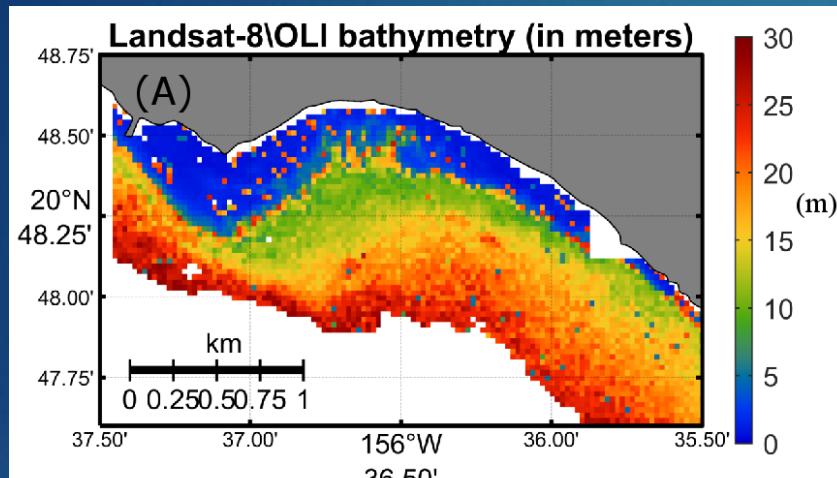
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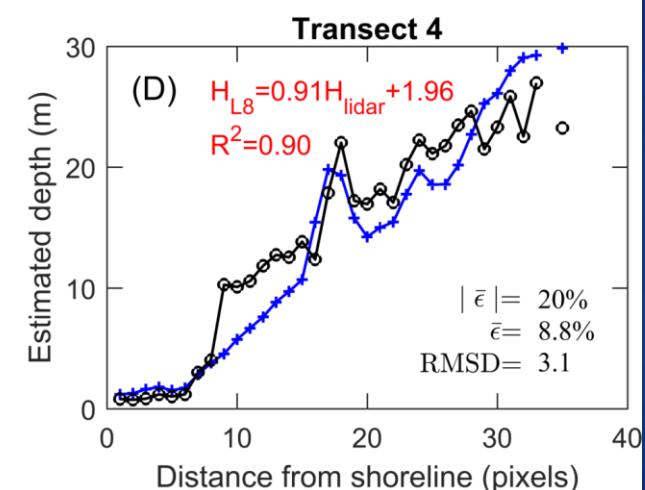
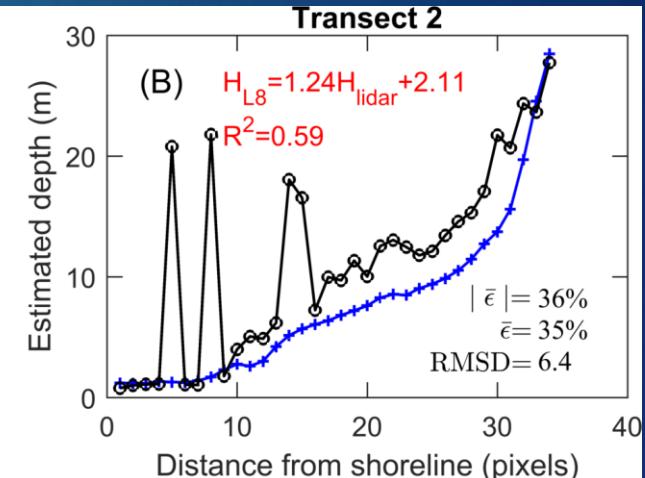
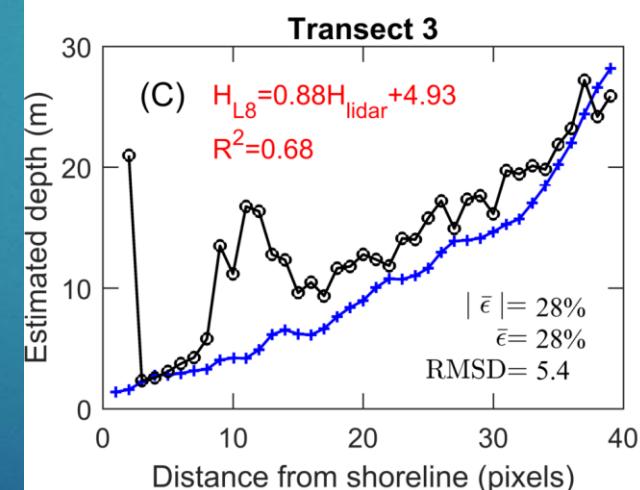
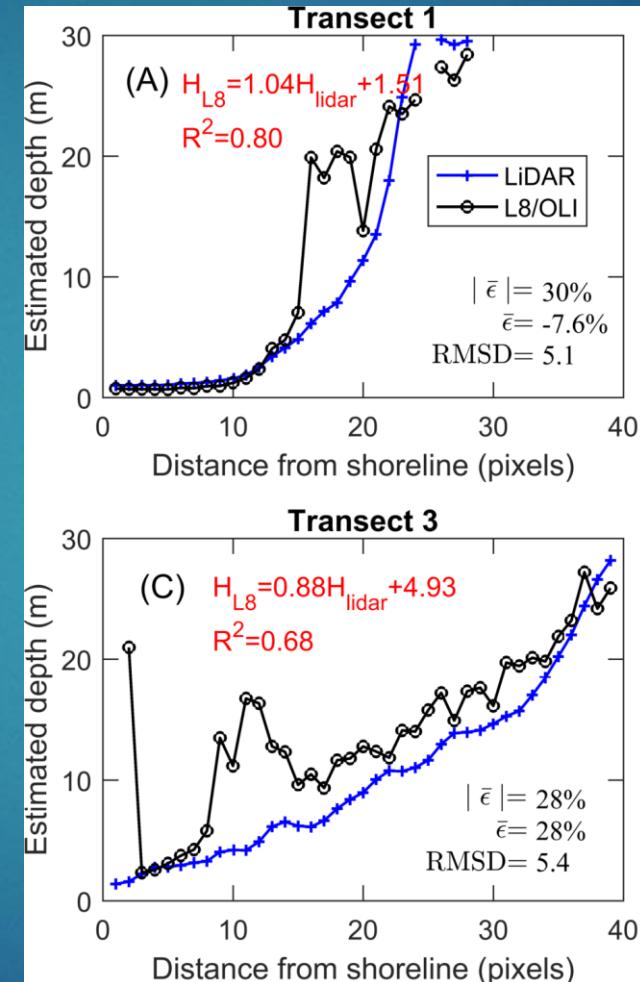
MAPE = 27%

# Bathymetry retrieval over coral reefs

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Selected transects



Comparison of model-retrieved depths and LiDAR measurements along four transects

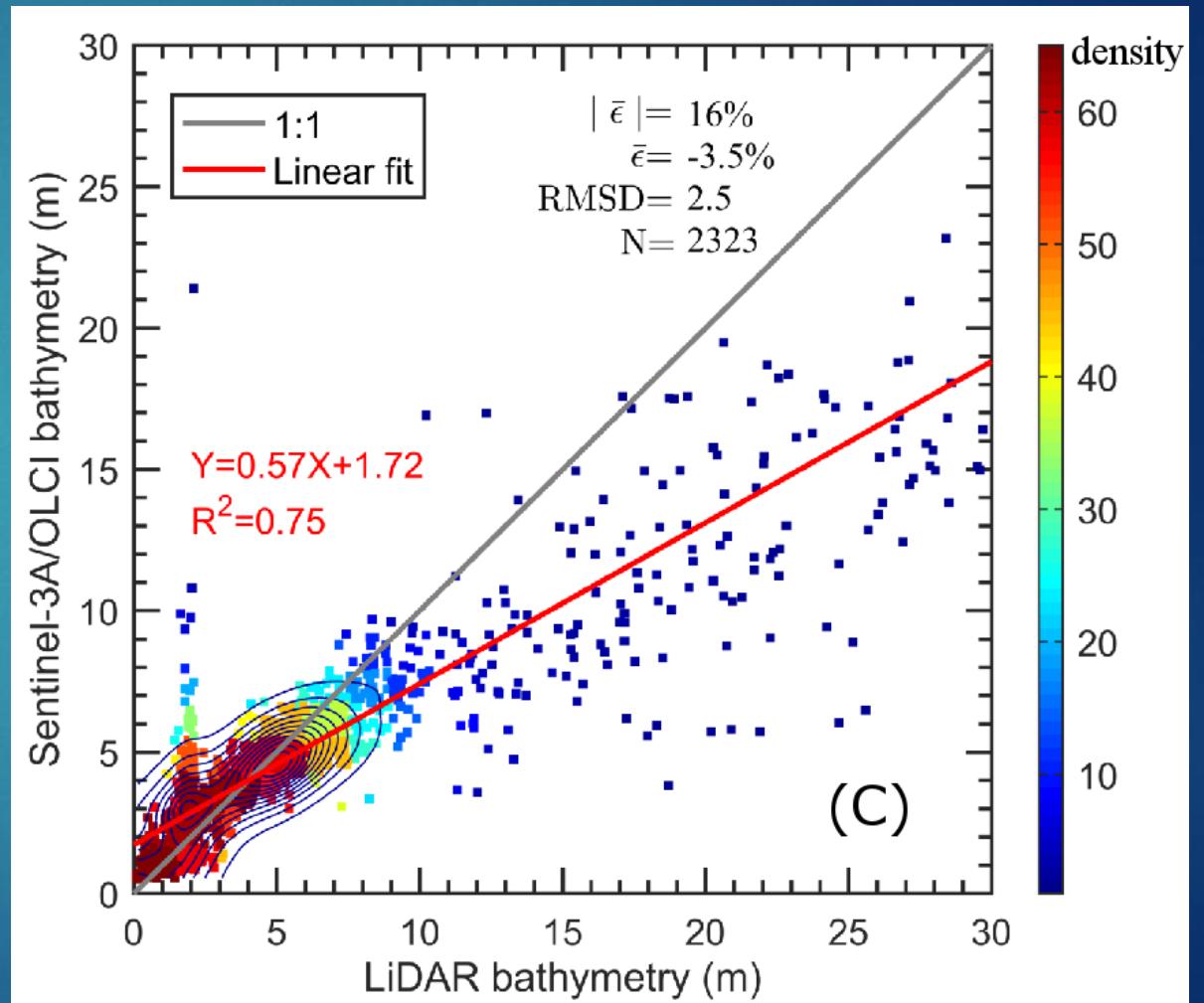
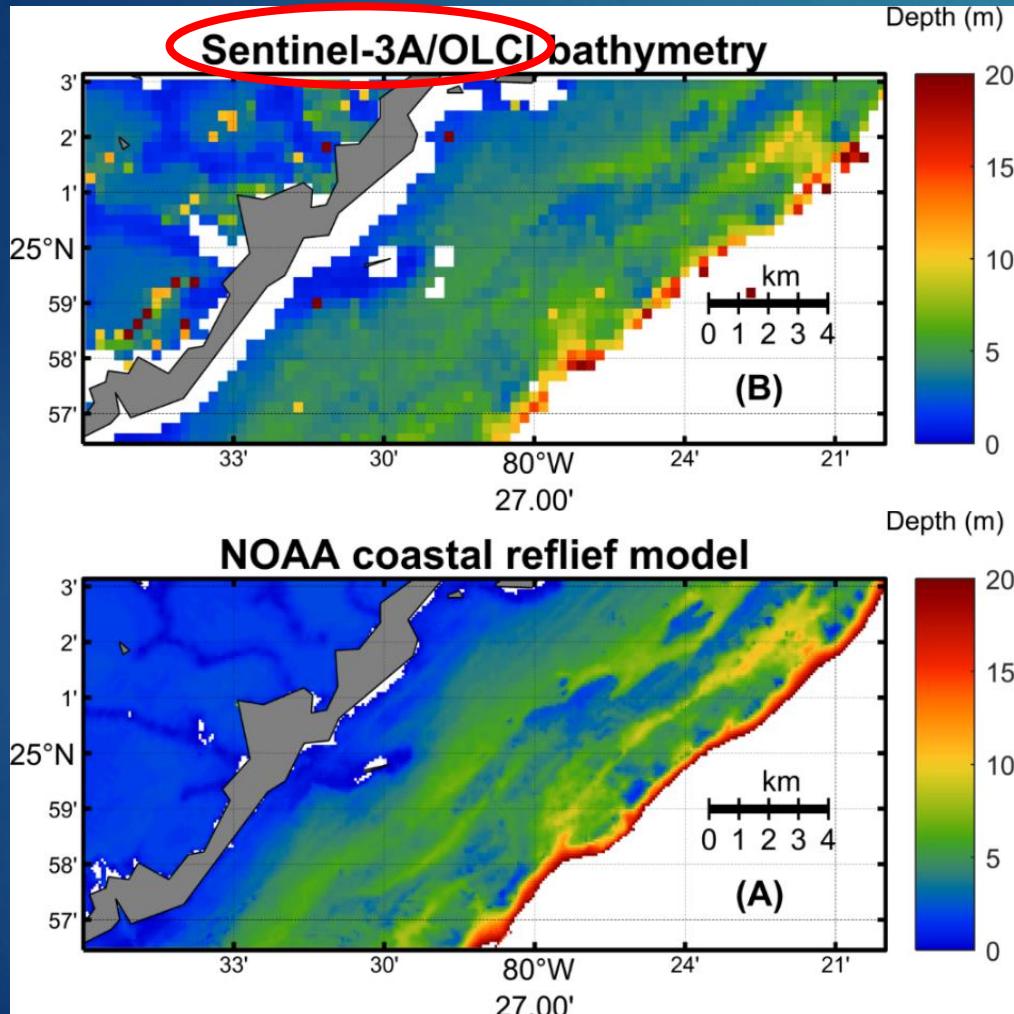
# Bathymetry retrieval over seagrass/algae environments

20



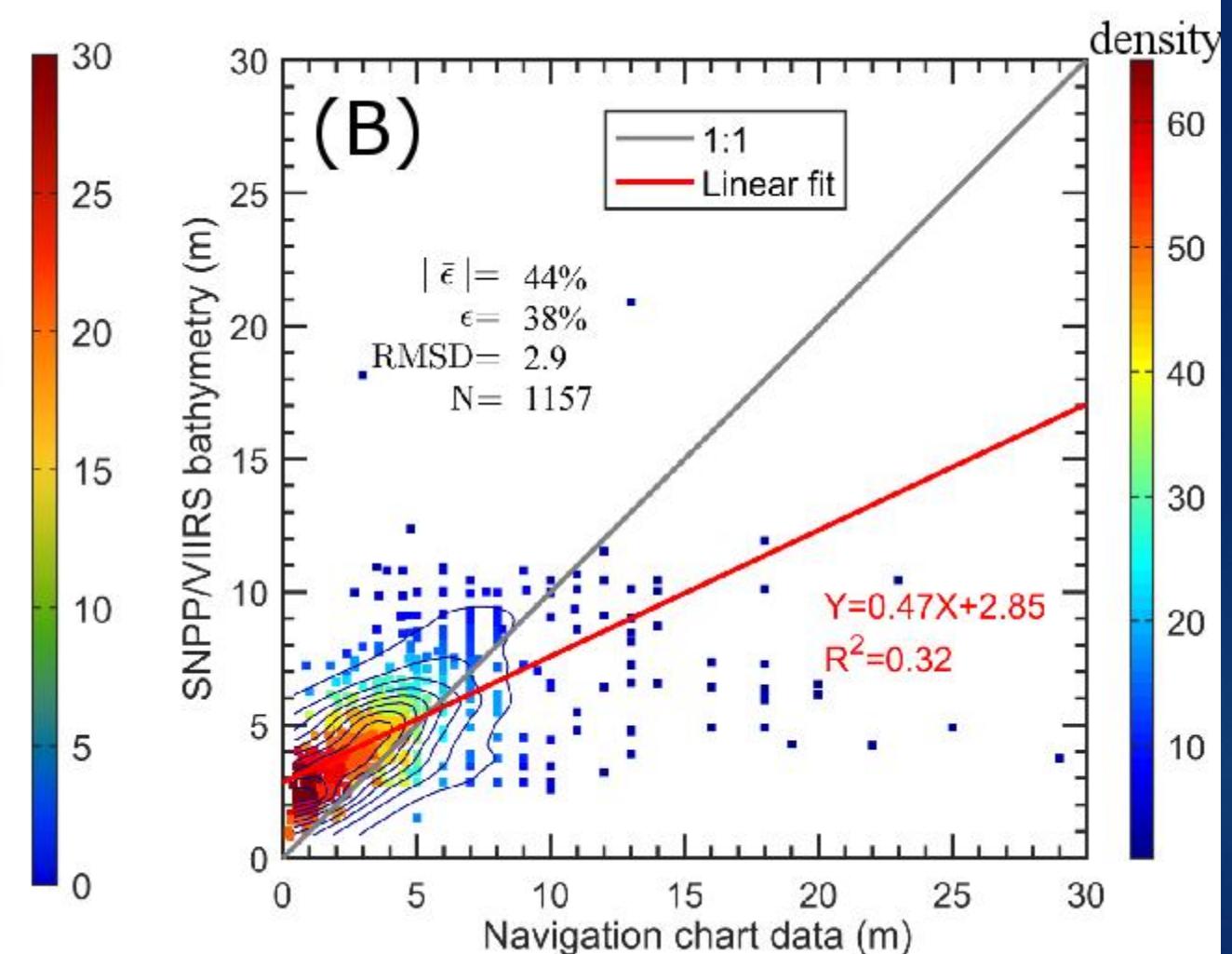
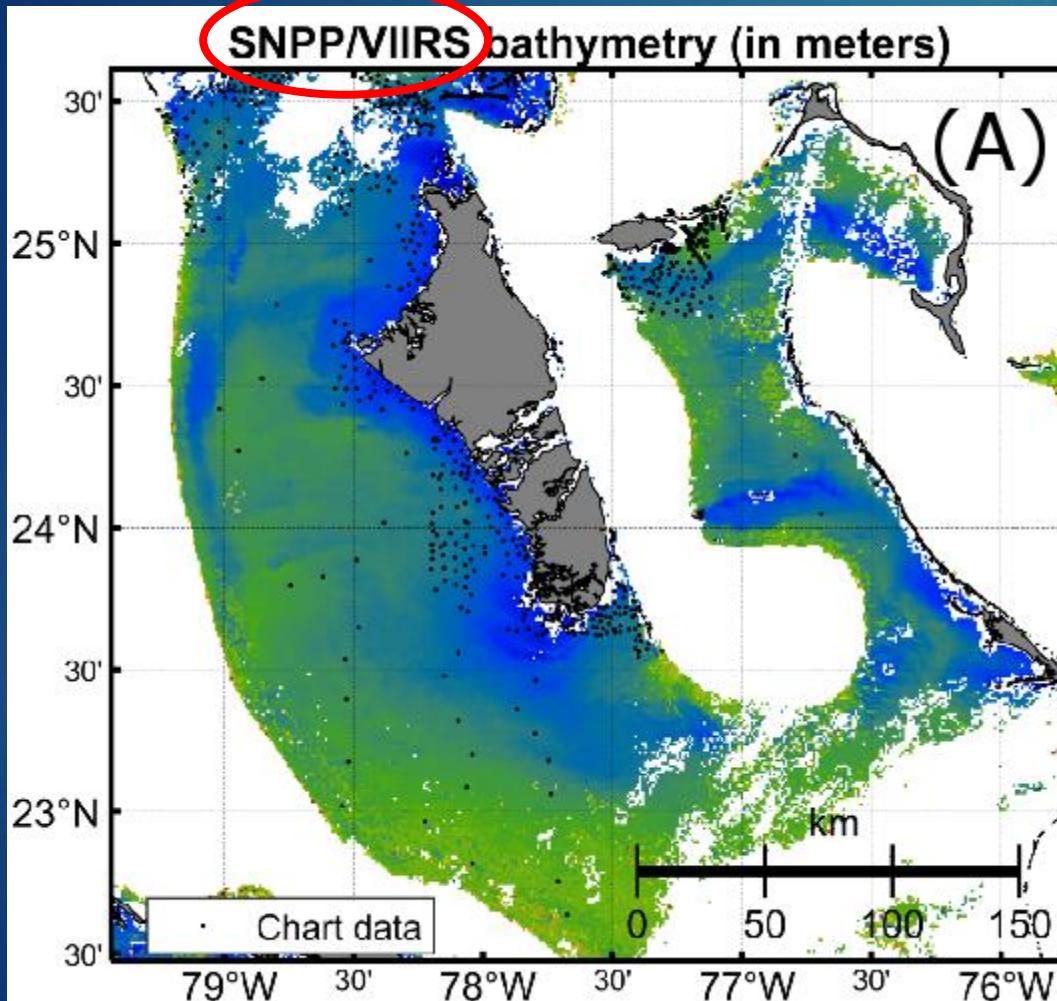
# Bathymetry retrieval over seagrass/algae environments

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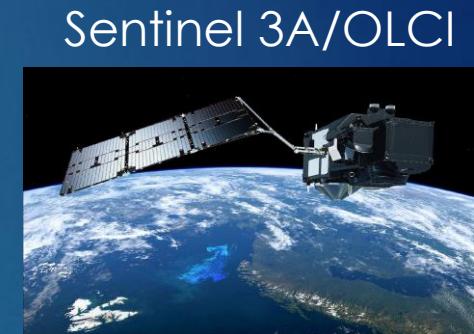
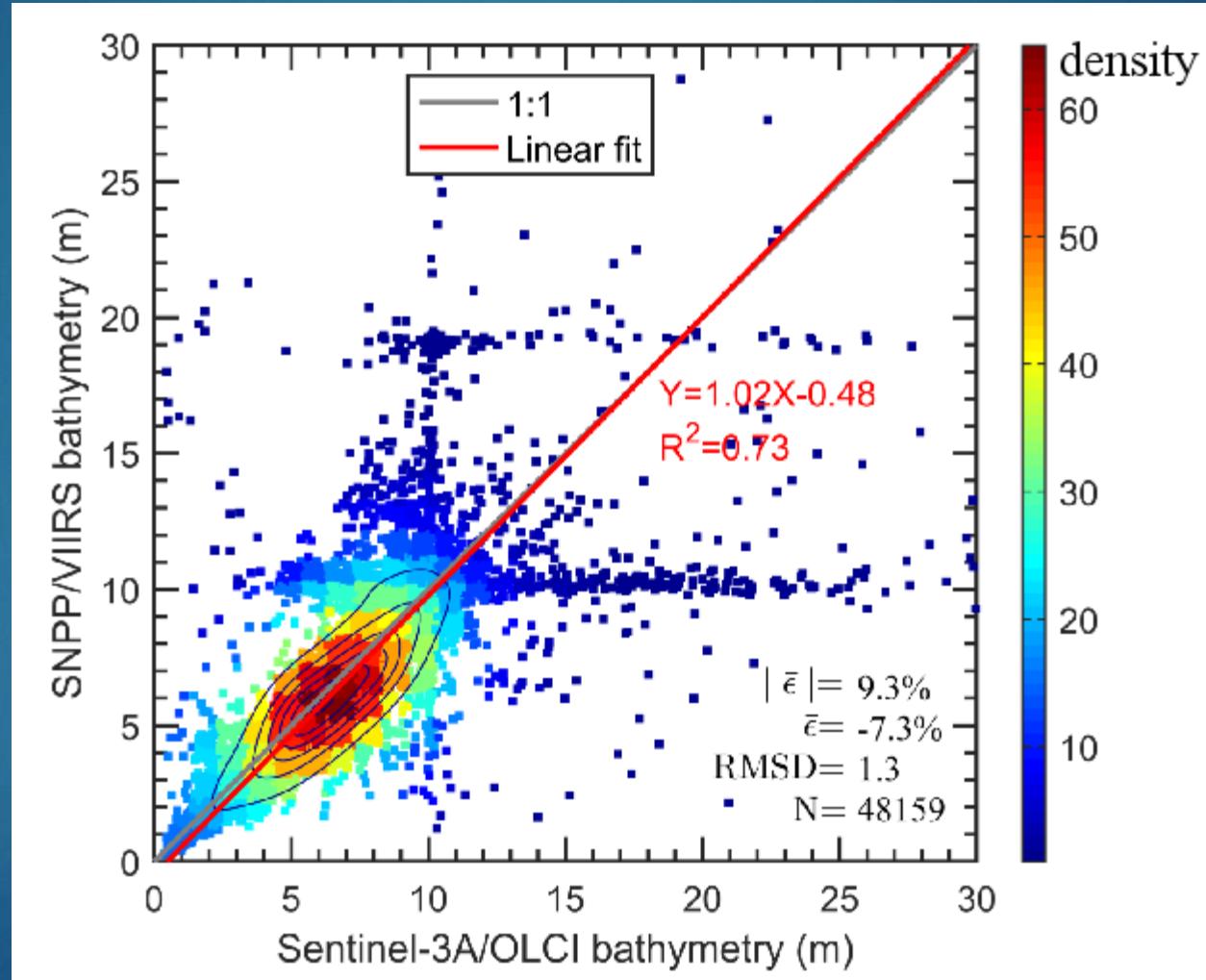
# Bathymetry retrieval over sandy environment

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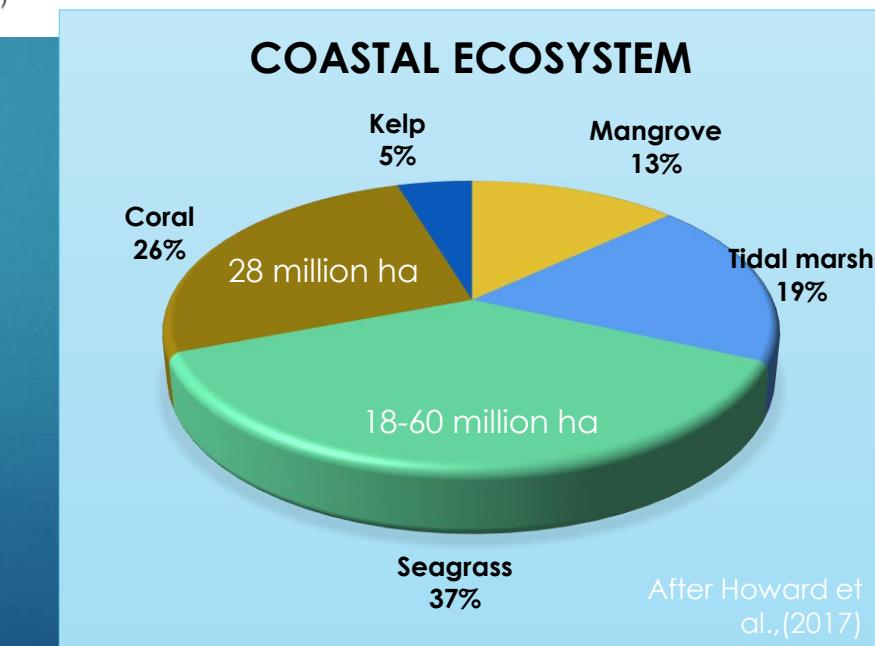
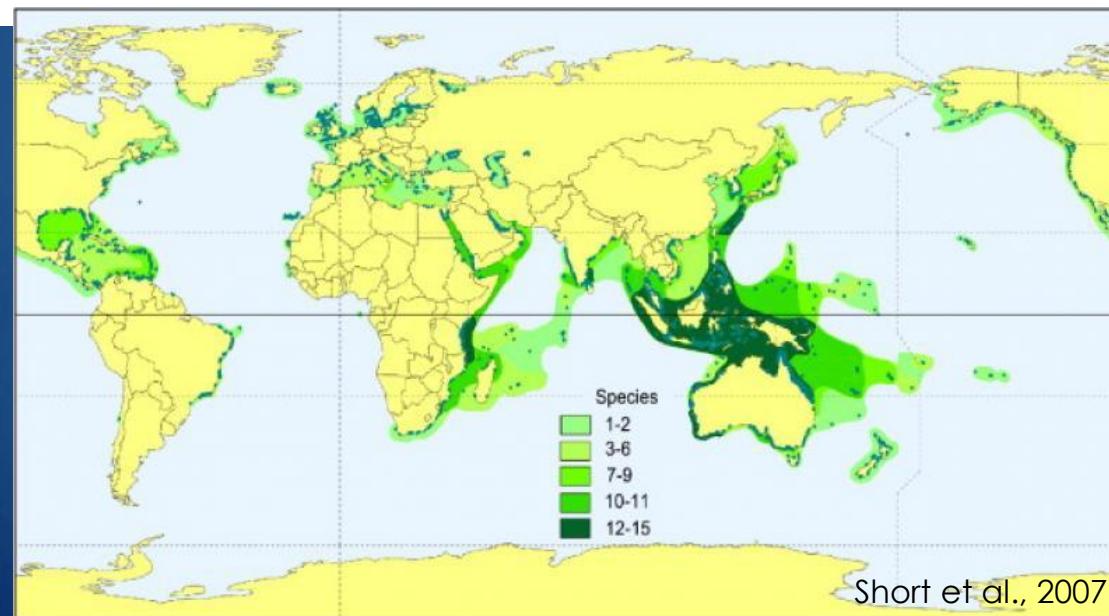
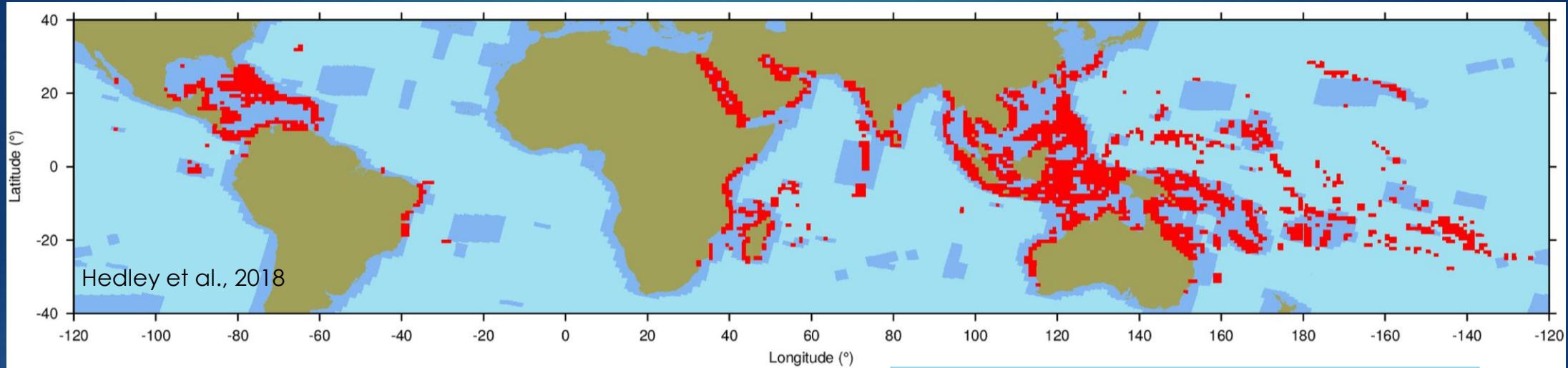
The Bahamas

# Inter-comparison of bathymetry retrievals from SNPP/VIIRS and Sentinel 3A/OLCI



# Geographic extent of coral reef and seagrass

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# Satellite ocean color data



All ocean color products are downloadable at [OCView](#) and [CoastWatch](#); Currently, no bathymetry product is available.

## Summary and future directions

- Satellite ocean color measurements provide an opportunity for mapping the shallow-water bathymetry on synoptic scales and frequently.
- We have developed an semi-analytical algorithm to retrieve the bathymetry map from multi-spectral ocean color images, with applications to SNPP/VIIRS, Sentinel 3A/OLCI, and Landsat 8/OLI.
- Future directions include assessment of depth uncertainties, etc.
- An experimental product of shallow-water bathymetry from VIIRS observations will be generated and evaluated with the availability of funding.

**Reference:**

Wei, J., Wang, M., Lee, Z.P., Briceño, H.O., Yu, X., Jiang, L., et al. (2020). Shallow water bathymetry with multi-spectral satellite ocean color sensors: Leveraging temporal variation in image data. *Remote Sensing of Environment*, 250, 112035.

**Thank you!**